zmPDSwR Chapter 2

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Data Read In

• Listing 2.1

```
setwd("~/Dropbox/Works/Class/Data_Science/R.WD/zmPDSwR/")
uciCar <- read.table("../../zmPDSwR/UCICar/car.data.csv", sep=",", header=TRUE)</pre>
```

Listing 2.2

```
class(uciCar)
```

```
## [1] "data.frame"
```

summary(uciCar)

```
##
      buying
                        maint
                                           doors
##
   Length: 1728
                     Length: 1728
                                       Length: 1728
   Class :character
                     Class :character Class :character
##
##
   Mode :character
                      Mode :character
                                        Mode :character
##
     persons
                        lug boot
                                           safety
## Length:1728
                     Length:1728
                                        Length: 1728
##
   Class :character
                      Class :character
                                        Class :character
##
   Mode :character
                     Mode :character
                                        Mode :character
##
      rating
## Length:1728
## Class :character
## Mode :character
```

```
dim(uciCar)
```

```
## [1] 1728 7
```

```
str(uciCar)
```

```
## 'data.frame': 1728 obs. of 7 variables:
## $ buying : chr "vhigh" "vhigh" "vhigh" "vhigh" ...
## $ maint : chr "vhigh" "vhigh" "vhigh" "vhigh" ...
## $ doors : chr "2" "2" "2" "2" ...
## $ persons : chr "2" "2" "2" ...
## $ lug_boot: chr "small" "small" "med" ...
## $ safety : chr "low" "med" "high" "low" ...
## $ rating : chr "unacc" "unacc" "unacc" ...
```

head(uciCar)

```
##
    buying maint doors persons lug_boot safety rating
## 1 vhigh vhigh
                     2
                            2
                                 small
                            2
## 2 vhigh vhigh
                     2
                                 small
                                          med unacc
## 3 vhigh vhigh
                     2
                            2
                                 small
                                         high unacc
## 4 vhigh vhigh
                     2
                            2
                                   med
                                          low
                                              unacc
## 5 vhigh vhigh
                     2
                            2
                                   med
                                          med unacc
## 6 vhigh vhigh
                     2
                            2
                                   med
                                         high unacc
```

Listing 2.3

```
d <- read.table(paste('http://archive.ics.uci.edu/ml/',
    'machine-learning-databases/statlog/german/german.data',sep=''),
    stringsAsFactors=F,header=F)
print(d[1:3,])</pre>
```

```
##
     V1 V2 V3 V4
                    V5 V6 V7 V8 V9 V10 V11 V12 V13 V14 V15 V16 V17
## 1 A11 6 A34 A43 1169 A65 A75 4 A93 A101
                                           4 A121 67 A143 A152
                                                                 2 A173
## 2 A12 48 A32 A43 5951 A61 A73 2 A92 A101
                                           2 A121
                                                  22 A143 A152
                                                                 1 A173
## 3 A14 12 A34 A46 2096 A61 A74 2 A93 A101
                                           3 A121 49 A143 A152
                                                                 1 A172
   V18 V19 V20 V21
## 1
      1 A192 A201
## 2
    1 A191 A201
                   2
## 3
      2 A191 A201
```

Listing 2.4

```
colnames(d) <- c('Status.of.existing.checking.account',
    'Duration.in.month', 'Credit.history', 'Purpose',
    'Credit.amount', 'Savings account/bonds',
    'Present.employment.since',
    'Installment.rate.in.percentage.of.disposable.income',
    'Personal.status.and.sex', 'Other.debtors/guarantors',
    'Present.residence.since', 'Property', 'Age.in.years',
    'Other.installment.plans', 'Housing',
    'Number.of.existing.credits.at.this.bank', 'Job',
    'Number.of.people.being.liable.to.provide.maintenance.for',
    'Telephone', 'foreign.worker', 'Good.Loan')
options(width=132)
print(d[1:3,])</pre>
```

##	Status.of.existing.che	cking.acc	ount Dura	ation.in.r	month Credi	t.history Pu	rpo		
	Credit.amount Savings ac					7	-		
##	1		A11		6	A34	Α		
43	1169	А	65						
##	2		A12		48	A32	Α		
43	5951	A	61						
##	3		A14		12	A34	Α		
46	2096	A	61						
##	Present.employment.since Installment.rate.in.percentage.of.disposable.inco								
me :	e Personal.status.and.sex Other.debtors/guarantors								
##	1 A	75							
4	A93			A101					
##	2 A	73							
2	A92			A101					
##	3 A	74							
2	A93			A101					
##	Present.residence.sinc				ner.install	ment.plans Ho	ous		
_	Number.of.existing.cred								
##		4 A12		67		A143	Α		
152				A173					
##		2 A12		22		A143	Α		
152				A173					
##		3 A12		49		A143	Α		
152				A172					
##	Number.of.people.being	.liable.t	o.provide	e.maintena	ance.for Te	lephone fore	ig		
	orker Good.Loan								
##					1	A192			
A20									
##					1	A191			
A20					_				
##					2	A191			
A20	1 1								

[•] Listing 2.5

```
mapping <- list('A11'='... < 0 DM',
 'A12'='0 <= ... < 200 DM',
 'A13'='... >= 200 DM / salary assignments for at least 1 year',
'A14'='no checking account',
 'A30'='no credits taken/all credits paid back duly',
 'A31'='all credits at this bank paid back duly',
 'A32'='existing credits paid back duly till now',
 'A33'='delay in paying off in the past',
 'A34'='critical account/other credits existing (not at this bank)',
 'A40'='car (new)',
 'A41'='car (used)',
 'A42'='furniture/equipment',
 'A43'='radio/television',
 'A44'='domestic appliances',
 'A45'='repairs',
 'A46'='education',
 'A47'='(vacation - does not exist?)',
 'A48'='retraining',
 'A49'='business',
 'A410'='others',
 'A61'='... < 100 DM',
 'A62'='100 <= ... < 500 DM',
 'A63'='500 <= ... < 1000 DM',
 'A64'='...>= 1000 DM',
 'A65'='unknown/ no savings account',
 'A71'='unemployed',
 'A72'='... < 1 year',
 'A73'='1 <= ... < 4 years',
 'A74'='4 <= ... < 7 years',
 'A75'='...>= 7 years',
 'A91'='male : divorced/separated',
 'A92'='female : divorced/separated/married',
 'A93'='male : single',
 'A94'='male : married/widowed',
 'A95'='female : single',
 'A101'='none',
 'A102'='co-applicant',
 'A103'='quarantor',
 'A121'='real estate',
 'A122'='if not A121 : building society savings agreement/life insurance',
 'A123'='if not A121/A122 : car or other, not in attribute 6',
 'A124'='unknown / no property',
 'A141'='bank',
 'A142'='stores',
 'A143'='none',
 'A151'='rent',
 'A152'='own',
 'A153'='for free',
 'A171'='unemployed/ unskilled - non-resident',
 'A172'='unskilled - resident',
 'A173'='skilled employee / official',
 'A174'='management/ self-employed/highly qualified employee/ officer',
 'A191'='none',
```

```
'A192'='yes, registered under the customers name',
'A201'='yes',
'A202'='no')
```

• Listing 2.6의 구조를 파악하기 위해서

```
sapply(d, class)
```

```
##
                         Status.of.existing.checking.account
Duration.in.month
                                                  "character"
"integer"
##
                                               Credit.history
Purpose
##
                                                  "character"
"character"
                                                Credit.amount
##
Savings account/bonds
                                                    "integer"
"character"
##
                                    Present.employment.since
                                                                    Installment.ra
te.in.percentage.of.disposable.income
                                                  "character"
"integer"
                                     Personal.status.and.sex
Other.debtors/quarantors
                                                  "character"
"character"
                                     Present.residence.since
##
Property
##
                                                    "integer"
"character"
##
                                                 Age.in.years
Other.installment.plans
##
                                                    "integer"
"character"
##
                                                      Housing
                                                                                 Nu
mber.of.existing.credits.at.this.bank
##
                                                  "character"
"integer"
                                                           Job Number.of.people.be
ing.liable.to.provide.maintenance.for
                                                  "character"
##
"integer"
##
                                                    Telephone
foreign.worker
##
                                                  "character"
"character"
##
                                                    Good.Loan
##
                                                    "integer"
```

```
head(d[, 4])
```

```
## [1] "A43" "A43" "A46" "A42" "A40" "A46"
```

```
mapping[head(d[, 4])]
```

```
## $A43
## [1] "radio/television"
## $A43
## [1] "radio/television"
##
## $A46
## [1] "education"
##
## $A42
## [1] "furniture/equipment"
##
## $A40
## [1] "car (new)"
##
## $A46
## [1] "education"
```

```
as.character(mapping[head(d[, 4])])
```

```
## [1] "radio/television" "radio/television" "education" "furni
ture/equipment" "car (new)"
## [6] "education"
```

• d 의 복제를 만들어 두고,

```
d.2 <- d
```

Listing 2.6

```
for(i in 1:dim(d)[2]) {
   if(class(d[, i])=="character") {
     d[, i] <- as.factor(as.character(mapping[d[, i]]))
     }
   }
   str(d)</pre>
```

```
## 'data.frame':
                   1000 obs. of 21 variables:
## $ Status.of.existing.checking.account
                                                            : Factor w/ 4 lev
els "... < 0 DM", "... >= 200 DM / salary assignments for at least 1 year",..: 1
3 4 1 1 4 4 3 4 3 ...
## $ Duration.in.month
                                                             : int 6 48 12 42
24 36 24 36 12 30 ...
## $ Credit.history
                                                             : Factor w/ 5 lev
els "all credits at this bank paid back duly",..: 2 4 2 4 3 4 4 4 2 ...
                                                            : Factor w/ 10 le
## $ Purpose
vels "business", "car (new)",..: 8 8 5 6 2 5 6 3 8 2 ...
## $ Credit.amount
                                                            : int 1169 5951
2096 7882 4870 9055 2835 6948 3059 5234 ...
## $ Savings account/bonds
                                                         : Factor w/ 5 lev
els ".. >= 1000 DM",..: 5 2 2 2 2 5 4 2 1 2 ...
## $ Present.employment.since
                                                            : Factor w/ 5 lev
els ".. >= 7 years",..: 1 3 4 4 3 3 1 3 4 5 ...
## $ Installment.rate.in.percentage.of.disposable.income : int 4 2 2 2 3
2 3 2 2 4 ...
## $ Personal.status.and.sex
                                                             : Factor w/ 4 lev
els "female : divorced/separated/married",..: 4 1 4 4 4 4 4 2 3 ...
## $ Other.debtors/guarantors
                                                            : Factor w/ 3 lev
els "co-applicant",..: 3 3 3 2 3 3 3 3 3 ...
## $ Present.residence.since
                                                            : int 4 2 3 4 4
4 4 2 4 2 ...
## $ Property
                                                             : Factor w/ 4 lev
els "if not A121 : building society savings agreement/life insurance",..: 3 3 3
1 4 4 1 2 3 2 ...
## $ Age.in.years
                                                             : int 67 22 49 4
5 53 35 53 35 61 28 ...
## $ Other.installment.plans
                                                            : Factor w/ 3 lev
els "bank", "none", ...: 2 2 2 2 2 2 2 2 2 2 ...
## $ Housing
                                                            : Factor w/ 3 lev
els "for free", "own",..: 2 2 2 1 1 1 2 3 2 2 ...
                                                            : int 2 1 1 1 2
## $ Number.of.existing.credits.at.this.bank
1 1 1 1 2 ...
## $ Job
                                                             : Factor w/ 4 lev
els "management/ self-employed/highly qualified employee/ officer",..: 2 2 4 2
## $ Number.of.people.being.liable.to.provide.maintenance.for: int 1 1 2 2 2
2 1 1 1 1 ...
## $ Telephone
                                                             : Factor w/ 2 lev
els "none", "yes, registered under the customers name": 2 1 1 1 1 2 1 2 1 1 ...
## $ foreign.worker
                                                            : Factor w/ 2 lev
els "no", "yes": 2 2 2 2 2 2 2 2 2 2 ...
## $ Good.Loan
                                                            : int 1 2 1 1 2
1 1 1 1 2 ...
```

```
d$Good.Loan <- factor(ifelse(d$Good.Loan == 1, "GoodLoan", "BadLoan"))
str(d)</pre>
```

```
## 'data.frame':
                   1000 obs. of 21 variables:
## $ Status.of.existing.checking.account
                                                             : Factor w/ 4 lev
els "... < 0 DM", "... >= 200 DM / salary assignments for at least 1 year",..: 1
3 4 1 1 4 4 3 4 3 ...
## $ Duration.in.month
                                                             : int 6 48 12 42
24 36 24 36 12 30 ...
## $ Credit.history
                                                             : Factor w/ 5 lev
els "all credits at this bank paid back duly",..: 2 4 2 4 3 4 4 4 2 ...
## $ Purpose
                                                             : Factor w/ 10 le
vels "business", "car (new)", ...: 8 8 5 6 2 5 6 3 8 2 ...
## $ Credit.amount
                                                            : int 1169 5951
2096 7882 4870 9055 2835 6948 3059 5234 ...
## $ Savings account/bonds
                                                         : Factor w/ 5 lev
els ".. >= 1000 DM",..: 5 2 2 2 2 5 4 2 1 2 ...
## $ Present.employment.since
                                                            : Factor w/ 5 lev
els ".. >= 7 years",..: 1 3 4 4 3 3 1 3 4 5 ...
## $ Installment.rate.in.percentage.of.disposable.income : int 4 2 2 2 3
2 3 2 2 4 ...
## $ Personal.status.and.sex
                                                             : Factor w/ 4 lev
els "female : divorced/separated/married",..: 4 1 4 4 4 4 4 2 3 ...
## $ Other.debtors/guarantors
                                                            : Factor w/ 3 lev
els "co-applicant",..: 3 3 3 2 3 3 3 3 3 ...
## $ Present.residence.since
                                                             : int 4 2 3 4 4
4 4 2 4 2 ...
## $ Property
                                                             : Factor w/ 4 lev
els "if not A121 : building society savings agreement/life insurance",..: 3 3 3
1 4 4 1 2 3 2 ...
## $ Age.in.years
                                                             : int 67 22 49 4
5 53 35 53 35 61 28 ...
## $ Other.installment.plans
                                                            : Factor w/ 3 lev
els "bank", "none", ..: 2 2 2 2 2 2 2 2 2 ...
## $ Housing
                                                            : Factor w/ 3 lev
els "for free", "own", ...: 2 2 2 1 1 1 2 3 2 2 ...
## $ Number.of.existing.credits.at.this.bank
                                                            : int 2 1 1 1 2
1 1 1 1 2 ...
## $ Job
                                                             : Factor w/ 4 lev
els "management/ self-employed/highly qualified employee/ officer",..: 2 2 4 2
## $ Number.of.people.being.liable.to.provide.maintenance.for: int 1 1 2 2 2
2 1 1 1 1 ...
## $ Telephone
                                                             : Factor w/ 2 lev
els "none", "yes, registered under the customers name": 2 1 1 1 1 2 1 2 1 1 ...
## $ foreign.worker
                                                             : Factor w/ 2 lev
els "no", "yes": 2 2 2 2 2 2 2 2 2 ...
                                                         : Factor w/ 2 lev
## $ Good.Loan
els "BadLoan", "GoodLoan": 2 1 2 2 1 2 2 2 1 ...
```

• for loop이 보기 싫다면,

```
l.char <- sapply(d.2, class) == "character"
l.char</pre>
```

```
##
                         Status.of.existing.checking.account
Duration.in.month
##
                                                          TRUE
FALSE
                                               Credit.history
##
Purpose
##
                                                         TRUE
TRUE
##
                                                Credit.amount
Savings account/bonds
                                                        FALSE
TRUE
##
                                    Present.employment.since
                                                                   Installment.ra
te.in.percentage.of.disposable.income
##
                                                         TRUE
FALSE
##
                                     Personal.status.and.sex
Other.debtors/guarantors
                                                         TRUE
TRUE
##
                                     Present.residence.since
Property
##
                                                        FALSE
TRUE
##
                                                 Age.in.years
Other.installment.plans
##
                                                        FALSE
TRUE
##
                                                      Housing
                                                                                Nu
mber.of.existing.credits.at.this.bank
##
                                                         TRUE
FALSE
                                                          Job Number.of.people.be
ing.liable.to.provide.maintenance.for
##
                                                         TRUE
FALSE
##
                                                    Telephone
foreign.worker
##
                                                         TRUE
TRUE
##
                                                    Good.Loan
##
                                                        FALSE
```

```
names(l.char) <- NULL
l.char</pre>
```

[1] TRUE FALSE TRUE TRUE FALSE TRUE TRUE FALSE TRUE TRUE FALSE TRUE FALSE

which(l.char)

```
d.char <- subset(d.2, select = l.char)
str(d.char)</pre>
```

```
1000 obs. of 13 variables:
## 'data.frame':
   $ Status.of.existing.checking.account: chr "A11" "A12" "A14" "A11" ...
##
## $ Credit.history
                                              "A34" "A32" "A34" "A32" ...
                                       : chr
## $ Purpose
                                       : chr
                                              "A43" "A43" "A46" "A42" ...
## $ Savings account/bonds
                                       : chr
                                              "A65" "A61" "A61" "A61" ...
                                       : chr
                                              "A75" "A73" "A74" "A74" ...
## $ Present.employment.since
                                              "A93" "A92" "A93" "A93" ...
## $ Personal.status.and.sex
                                       : chr
                                              "A101" "A101" "A101" "A103" ...
## $ Other.debtors/quarantors
                                       : chr
                                              "A121" "A121" "A121" "A122" ...
## $ Property
                                       : chr
## $ Other.installment.plans
                                       : chr
                                              "A143" "A143" "A143" ...
## $ Housing
                                       : chr
                                              "A152" "A152" "A152" "A153" ...
## $ Job
                                       : chr
                                              "A173" "A173" "A172" "A173" ...
## $ Telephone
                                       : chr
                                              "A192" "A191" "A191" ...
                                              "A201" "A201" "A201" "A201" ...
## $ foreign.worker
                                       : chr
```

```
d.factor <- sapply(d.char, function(x) factor(as.character(mapping[x])), simpli
fy=FALSE)
str(d.factor)</pre>
```

```
## List of 13
## $ Status.of.existing.checking.account: Factor w/ 4 levels "... < 0 DM", "...
>= 200 DM / salary assignments for at least 1 year",..: 1 3 4 1 1 4 4 3 4 3 ...
                                        : Factor w/ 5 levels "all credits at t
## $ Credit.history
his bank paid back duly",..: 2 4 2 4 3 4 4 4 2 ...
## $ Purpose
                                        : Factor w/ 10 levels "business", "car
(new)",..: 8 8 5 6 2 5 6 3 8 2 ...
## $ Savings account/bonds
                                       : Factor w/ 5 levels ".. >= 1000 D
M",..: 5 2 2 2 2 5 4 2 1 2 ...
                                 : Factor w/ 5 levels ".. >= 7 year
## $ Present.employment.since
s",..: 1 3 4 4 3 3 1 3 4 5 ...
## $ Personal.status.and.sex
                                        : Factor w/ 4 levels "female : divorce
d/separated/married",..: 4 1 4 4 4 4 4 2 3 ...
## $ Other.debtors/guarantors
                                       : Factor w/ 3 levels "co-applican
t",..: 3 3 3 2 3 3 3 3 3 3 ...
## $ Property
                                        : Factor w/ 4 levels "if not A121 : bu
ilding society savings agreement/life insurance",..: 3 3 3 1 4 4 1 2 3 2 ...
## $ Other.installment.plans
                                       : Factor w/ 3 levels "bank", "none",..:
2 2 2 2 2 2 2 2 2 2 ...
## $ Housing
                                        : Factor w/ 3 levels "for free", "ow
n",..: 2 2 2 1 1 1 2 3 2 2 ...
## $ Job
                                        : Factor w/ 4 levels "management/ sel
f-employed/highly qualified employee/ officer",..: 2 2 4 2 2 4 2 1 4 1 ...
## $ Telephone
                                        : Factor w/ 2 levels "none", "yes, regi
stered under the customers name": 2 1 1 1 1 2 1 2 1 1 ...
## $ foreign.worker
                                       : Factor w/ 2 levels "no", "yes": 2 2 2
2 2 2 2 2 2 2 ...
```

```
d.2[1.char] <- d.factor
str(d.2)</pre>
```

```
## 'data.frame':
                   1000 obs. of 21 variables:
## $ Status.of.existing.checking.account
                                                            : Factor w/ 4 lev
els "... < 0 DM", "... >= 200 DM / salary assignments for at least 1 year",..: 1
3 4 1 1 4 4 3 4 3 ...
## $ Duration.in.month
                                                             : int 6 48 12 42
24 36 24 36 12 30 ...
## $ Credit.history
                                                             : Factor w/ 5 lev
els "all credits at this bank paid back duly",..: 2 4 2 4 3 4 4 4 2 ...
                                                            : Factor w/ 10 le
## $ Purpose
vels "business", "car (new)",..: 8 8 5 6 2 5 6 3 8 2 ...
## $ Credit.amount
                                                            : int 1169 5951
2096 7882 4870 9055 2835 6948 3059 5234 ...
## $ Savings account/bonds
                                                         : Factor w/ 5 lev
els ".. >= 1000 DM",..: 5 2 2 2 2 5 4 2 1 2 ...
## $ Present.employment.since
                                                            : Factor w/ 5 lev
els ".. >= 7 years",..: 1 3 4 4 3 3 1 3 4 5 ...
## $ Installment.rate.in.percentage.of.disposable.income : int 4 2 2 2 3
2 3 2 2 4 ...
## $ Personal.status.and.sex
                                                             : Factor w/ 4 lev
els "female : divorced/separated/married",..: 4 1 4 4 4 4 4 2 3 ...
## $ Other.debtors/guarantors
                                                            : Factor w/ 3 lev
els "co-applicant",..: 3 3 3 2 3 3 3 3 3 ...
## $ Present.residence.since
                                                            : int 4 2 3 4 4
4 4 2 4 2 ...
## $ Property
                                                             : Factor w/ 4 lev
els "if not A121 : building society savings agreement/life insurance",..: 3 3 3
1 4 4 1 2 3 2 ...
## $ Age.in.years
                                                             : int 67 22 49 4
5 53 35 53 35 61 28 ...
## $ Other.installment.plans
                                                            : Factor w/ 3 lev
els "bank", "none", ...: 2 2 2 2 2 2 2 2 2 2 ...
## $ Housing
                                                            : Factor w/ 3 lev
els "for free", "own",..: 2 2 2 1 1 1 2 3 2 2 ...
## $ Number.of.existing.credits.at.this.bank
                                                            : int 2 1 1 1 2
1 1 1 1 2 ...
## $ Job
                                                             : Factor w/ 4 lev
els "management/ self-employed/highly qualified employee/ officer",..: 2 2 4 2
## $ Number.of.people.being.liable.to.provide.maintenance.for: int 1 1 2 2 2
2 1 1 1 1 ...
## $ Telephone
                                                             : Factor w/ 2 lev
els "none", "yes, registered under the customers name": 2 1 1 1 1 2 1 2 1 1 ...
## $ foreign.worker
                                                            : Factor w/ 2 lev
els "no", "yes": 2 2 2 2 2 2 2 2 2 2 ...
## $ Good.Loan
                                                            : int 1 2 1 1 2
1 1 1 1 2 ...
```

```
d.2$Good.Loan <- factor(ifelse(d.2$Good.Loan == 1, "GoodLoan", "BadLoan"))
str(d.2)</pre>
```

```
## 'data.frame':
                   1000 obs. of 21 variables:
## $ Status.of.existing.checking.account
                                                             : Factor w/ 4 lev
els "... < 0 DM", "... >= 200 DM / salary assignments for at least 1 year",..: 1
3 4 1 1 4 4 3 4 3 ...
## $ Duration.in.month
                                                             : int 6 48 12 42
24 36 24 36 12 30 ...
## $ Credit.history
                                                             : Factor w/ 5 lev
els "all credits at this bank paid back duly",..: 2 4 2 4 3 4 4 4 2 ...
                                                             : Factor w/ 10 le
## $ Purpose
vels "business", "car (new)",..: 8 8 5 6 2 5 6 3 8 2 ...
## $ Credit.amount
                                                            : int 1169 5951
2096 7882 4870 9055 2835 6948 3059 5234 ...
## $ Savings account/bonds
                                                            : Factor w/ 5 lev
els ".. >= 1000 DM",..: 5 2 2 2 2 5 4 2 1 2 ...
## $ Present.employment.since
                                                            : Factor w/ 5 lev
els ".. >= 7 years",..: 1 3 4 4 3 3 1 3 4 5 ...
## $ Installment.rate.in.percentage.of.disposable.income : int 4 2 2 2 3
2 3 2 2 4 ...
## $ Personal.status.and.sex
                                                             : Factor w/ 4 lev
els "female : divorced/separated/married",..: 4 1 4 4 4 4 4 2 3 ...
## $ Other.debtors/guarantors
                                                             : Factor w/ 3 lev
els "co-applicant",..: 3 3 3 2 3 3 3 3 3 ...
## $ Present.residence.since
                                                             : int 4 2 3 4 4
4 4 2 4 2 ...
## $ Property
                                                             : Factor w/ 4 lev
els "if not A121 : building society savings agreement/life insurance",..: 3 3 3
1 4 4 1 2 3 2 ...
## $ Age.in.years
                                                             : int 67 22 49 4
5 53 35 53 35 61 28 ...
## $ Other.installment.plans
                                                            : Factor w/ 3 lev
els "bank", "none", ..: 2 2 2 2 2 2 2 2 2 ...
## $ Housing
                                                            : Factor w/ 3 lev
els "for free", "own", ...: 2 2 2 1 1 1 2 3 2 2 ...
                                                            : int 2 1 1 1 2
## $ Number.of.existing.credits.at.this.bank
1 1 1 1 2 ...
## $ Job
                                                             : Factor w/ 4 lev
els "management/ self-employed/highly qualified employee/ officer",..: 2 2 4 2
## $ Number.of.people.being.liable.to.provide.maintenance.for: int 1 1 2 2 2
2 1 1 1 1 ...
## $ Telephone
                                                             : Factor w/ 2 lev
els "none", "yes, registered under the customers name": 2 1 1 1 1 2 1 2 1 1 ...
## $ foreign.worker
                                                             : Factor w/ 2 lev
els "no", "yes": 2 2 2 2 2 2 2 2 2 ...
## $ Good.Loan
                                                         : Factor w/ 2 lev
els "BadLoan", "GoodLoan": 2 1 2 2 1 2 2 2 1 ...
```

• 몇 가지 자료 검색

```
d[1:3, "Purpose"]
```

[1] radio/television radio/television education
10 Levels: business car (new) car (used) domestic appliances education furni
ture/equipment others radio/television ... retraining

summary(d\$Purpose)

##	business		car (used)	domestic applian
ces	education	furniture/equipment		
##	97	234	103	
12	50	181		
##	others	radio/television	repairs	retrain
ing				
##	12	280	22	
9				
##	12	280	22	

Listing 7

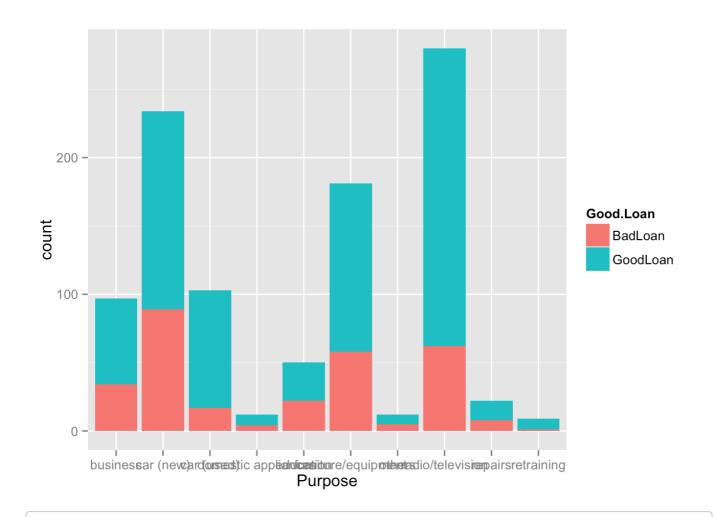
```
table("Purpose" = d$Purpose, "Good Loan?" = d$Good.Loan)
```

```
##
                        Good Loan?
                         BadLoan GoodLoan
## Purpose
##
    business
                              34
                                        63
##
    car (new)
                              89
                                       145
##
    car (used)
                              17
                                        86
##
     domestic appliances
                               4
                                         8
##
     education
                              22
                                        28
##
    furniture/equipment
                              58
                                       123
                               5
##
     others
                                         7
    radio/television
##
                              62
                                       218
                               8
##
     repairs
                                        14
##
     retraining
                               1
                                         8
```

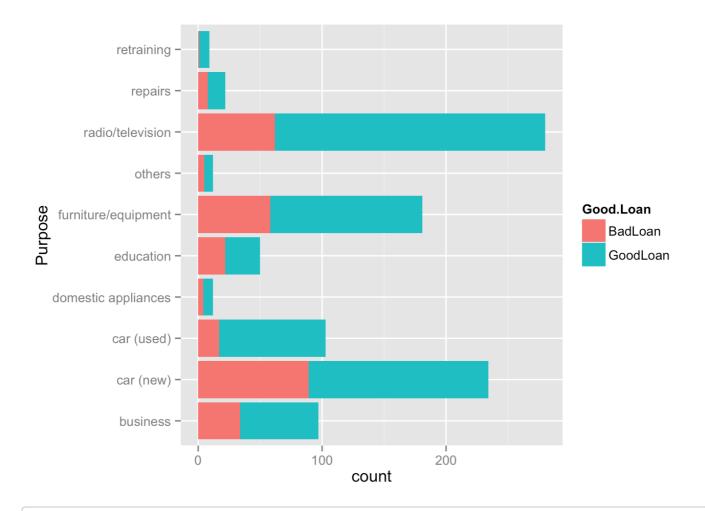
```
options(digits=2)
prop.table(table("Purpose" = d$Purpose, "Good Loan?" = d$Good.Loan), 1)
```

```
##
                        Good Loan?
## Purpose
                         BadLoan GoodLoan
##
     business
                            0.35
                                      0.65
##
     car (new)
                            0.38
                                      0.62
##
                             0.17
                                      0.83
     car (used)
##
     domestic appliances
                            0.33
                                      0.67
##
     education
                            0.44
                                      0.56
##
     furniture/equipment
                            0.32
                                      0.68
##
                             0.42
                                      0.58
     others
##
    radio/television
                            0.22
                                      0.78
##
                            0.36
     repairs
                                      0.64
##
     retraining
                             0.11
                                      0.89
```

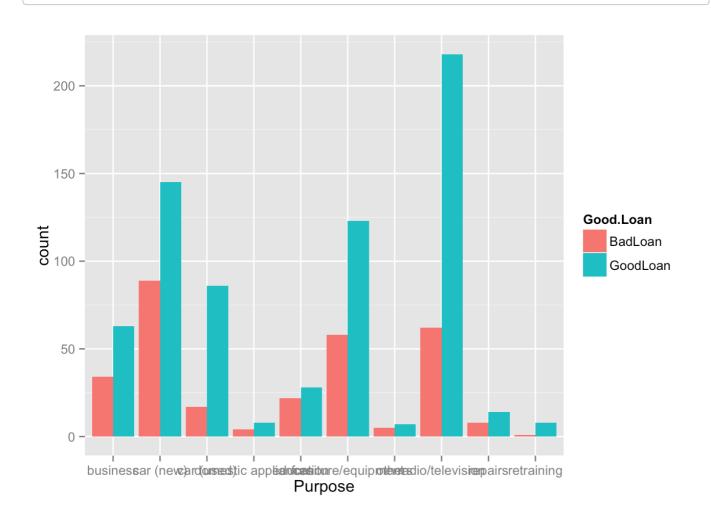
```
library(ggplot2)
ggplot(d) + geom_bar(aes(x=Purpose, fill=Good.Loan))
```



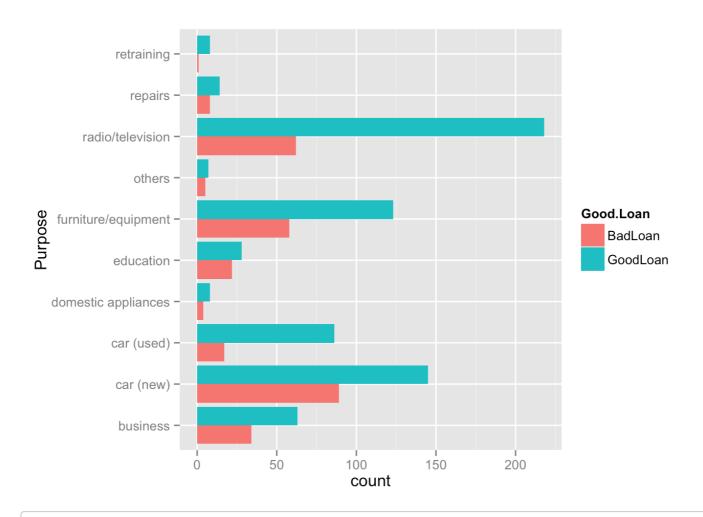
ggplot(d) + geom_bar(aes(x=Purpose, fill=Good.Loan)) + coord_flip()



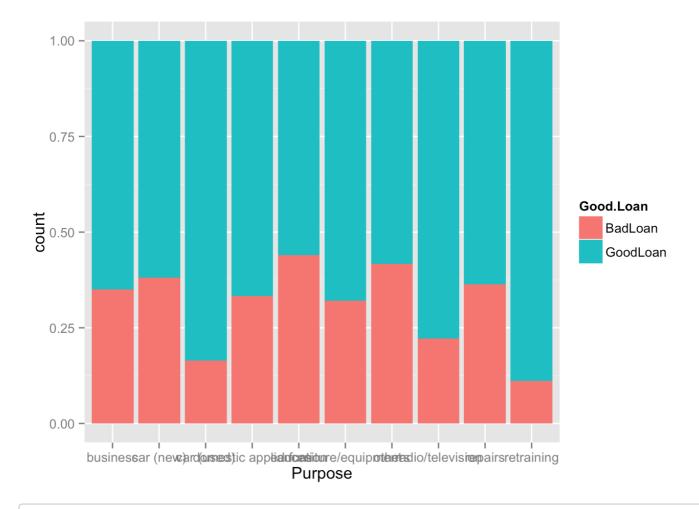
ggplot(d) + geom_bar(aes(x=Purpose, fill=Good.Loan), position="dodge")



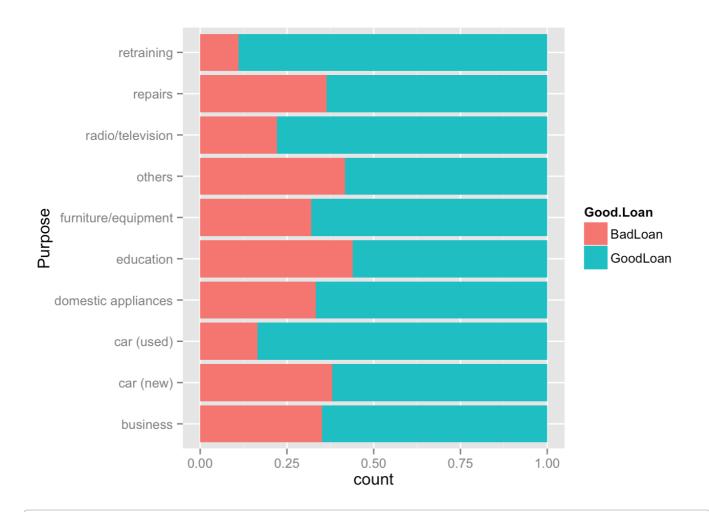
ggplot(d) + geom_bar(aes(x=Purpose, fill=Good.Loan), position="dodge") + coor d_flip()



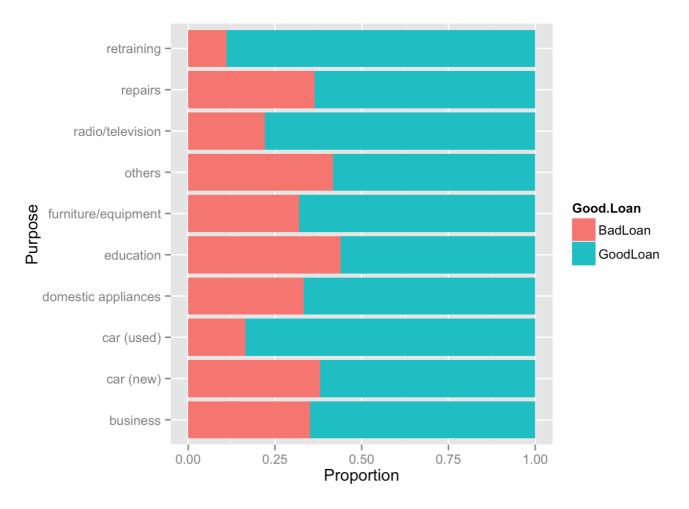
ggplot(d) + geom_bar(aes(x=Purpose, fill=Good.Loan), position="fill")



ggplot(d) + geom_bar(aes(x=Purpose, fill=Good.Loan), position="fill") + coord_f
lip()



ggplot(d) + geom_bar(aes(x=Purpose, fill=Good.Loan), position="fill") + coord_f
lip() + ylab("Proportion")



한글화

```
theme.kr <- theme(axis.title.x = element_text(family="HCR Batang LVT"),
axis.title.y = element_text(family="HCR Batang LVT"),
axis.text.x = element_text(family="HCR Batang LVT"),
axis.text.y = element_text(family="HCR Batang LVT"),
plot.title = element_text(family="HCR Batang LVT"),
legend.title = element_text(family="HCR Batang LVT"),
legend.text = element_text(family="HCR Batang LVT"))
ggplot(d) + geom_bar(aes(x=Purpose, fill=Good.Loan), position="fill") + coord_f
lip() +
    theme.kr +
    ylab("비율") + xlab("대출목적") +
    labs(fill="신용판정") +
    ggtitle("대출 목적과 신용등급") +
    scale_fill_discrete(labels=c("불량", "양호"))
```

